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## **Report Title**

Fiber Optic Coupled Raman Based Detection of Hazardous Liquids Concealed in Commercial Products

### **ABSTRACT**

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## Research Article

# Fiber Optic Coupled Raman Based Detection of Hazardous Liquids Concealed in Commercial Products

**Michael L. Ramírez-Cedeño,<sup>1,2</sup> Natalie Gaensbauer,<sup>3</sup> Hilsamar Félix-Rivera,<sup>1</sup> William Ortiz-Rivera,<sup>1</sup> Leonardo Pacheco-Londoño,<sup>1</sup> and Samuel P. Hernández-Rivera<sup>1</sup>**

<sup>1</sup> ALERT-DHS Center of Excellence, Center for Chemical Sensors Development, Department of Chemistry, University of Puerto Rico-Mayagüez, P.O. Box 9000, Mayagüez, PR 00681-9000, USA

<sup>2</sup> U.S. Department of the Treasury, Bureau of Engraving and Printing, Washington, DC 20228, Boston, USA

<sup>3</sup> Mechanical and Industrial Engineering Department, Northeastern University, 360 Huntington Avenue, Boston, MA 02115-5000, USA

Correspondence should be addressed to Samuel P. Hernández-Rivera, samuel.hernandez3@upr.edu

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Raman spectroscopy has been widely proposed as a technique to nondestructively and noninvasively interrogate the contents of glass and plastic bottles. In this work, Raman spectroscopy is used in a concealed threat scenario where hazardous liquids have been intentionally mixed with common consumer products to mask its appearance or spectra. The hazardous liquids under consideration included the chemical warfare agent (CWA) simulant triethyl phosphate (TEP), hydrogen peroxide, and acetone as representative of toxic industrial compounds (TICs). Fiber optic coupled Raman spectroscopy (FOCRS) and partial least squares (PLS) algorithm analysis were used to quantify hydrogen peroxide in whiskey, acetone in perfume, and TEP in colored beverages. Spectral data was used to evaluate if the hazardous liquids can be successfully concealed in consumer products. Results demonstrated that FOC-RS systems were able to discriminate between nonhazardous consumer products and mixtures with hazardous materials at concentrations lower than 5%.

## 1. Introduction

In August 2006, a terrorist plot to destroy aircrafts on transatlantic flights was discovered and timely stopped in London. The plan involved the use of liquid explosives stored in beverage bottles that would pass checkpoints without being detected [1]. The liquids were going to be mixed in flight to create an improvised explosive device (IED) that was going to be left in the aircraft and detonated remotely after the aircraft landed. Immediately after the event, airport security agencies in the United Kingdom and the United States of America established a ban on all liquids except medicines and infant food beyond checkpoints. The position of airport security officials has changed several times to allow certain amount of liquid or gel-based products. However, when or how terrorists would try to pass hazardous liquids into ports, government buildings, or public areas to generate threats using explosives or chemical agents is unpredictable.

The possibility of using liquid explosives for terrorism purposes is accompanied by the use of chemical warfare agents (CWAs) or toxic industrial compounds (TICs) for the same purposes. Such chemicals, which can be accessed in large quantities, can be extremely toxic on contact or inhalation even at small quantities [2, 3]. The establishment of current regulations also recognizes the challenges of detecting dangerous liquids when hidden or mixed within common nondangerous products. For this reason, it is important to develop methodologies that would enable to differentiate between common products and compounds that can be combined for terrorism intents [4].

Normal or spontaneous Raman spectroscopy (RS) is one of the most promising tools under consideration [5–7]. Current systems are portable, sensitive, and have a wide variety of accessories to tailor applications in the field and in the laboratory [8–10]. The technique is based on inelastic scattering which brings information on vibrational signatures

of molecules; therefore, it can be used as a specific means of detection. One of the strengths of RS is that it is able to analyze samples through various transparent glass and plastic containers [11–14]. This allows noninvasive, nondestructive inspection of the content of a container without opening minimizes exposure to potentially harmful substances and helps to speed the screening process. Since water does not present a strong signature in RS measurements, such systems are able to characterize aqueous-based commercial products. In addition, RS data can be successfully combined with chemometrics algorithms such as principal components analysis (PCA), partial least squares (PLS) regression analysis, and discriminant analysis (DA) for improved detection and quantification in a variety of matrices [15–17].

Principal components analysis (PCA) is very useful as a data reduction technique for spectroscopic analysis. In PCA, spectra are projected in space as orthogonal variables known as vectors or principal components (PCs). The goal is to capture as much variance as possible with the least amount of vectors (PCs) while reducing unwanted noise by transferring to less contributing PCs. Usually data is pretreated to smooth random differences and to bring out subtle differences not perceivable by simple evaluation of spectra by eye sight. Each component has a loading and a score. The loading describes the spectral features in the original spectra that are captured by the component, and the score tells how the spectrum of each PC compares/contributes to the original (experimental) spectra in terms of that particular component by assigning a value. Data is then visualized as a plot of scores which shows how different or similar are samples, data groups (classes), or the whole data set. In PLS, the variation observed during a PCA regression analysis is correlated to changes in concentration or other measurable property performing a regression of data variance ( $x$ ) versus a known variable ( $y$ ) [18, 19].

In this study, FOCRS was used to characterize samples in which hazardous liquids were concealed in commercial products by mixing them with common liquids in their original containers. Common commercial products such as liquors, perfumes, and beverages can exhibit color or chemical composition that can mask the presence of the contaminant either by spectral congestion or more critically by exhibiting endogenous fluorescence. Hydrogen peroxide was used as a simulant for peroxide-based materials or precursors that can be used as homemade explosives. TEP is a structural analog of a CWA and therefore is commonly used as a chemical simulant for it. Acetone was used as representative of industrial solvents classified as TICs, but it is also a precursor of the family of cyclic organic peroxides collectively referred to as acetone peroxide homemade explosives. The results suggested that FOCRS can be used to discriminate and quantify the hazardous liquid concealed in the commercial products.

## 2. Experimental Section

**2.1. Materials and Reagents.** The commercial liquid products employed in this study were Gatorade Frost Glacier Freeze (blue color), Fruit Punch (red color) and Orange (orange color), Dewar's White Label whiskey, Ron Bacardi light

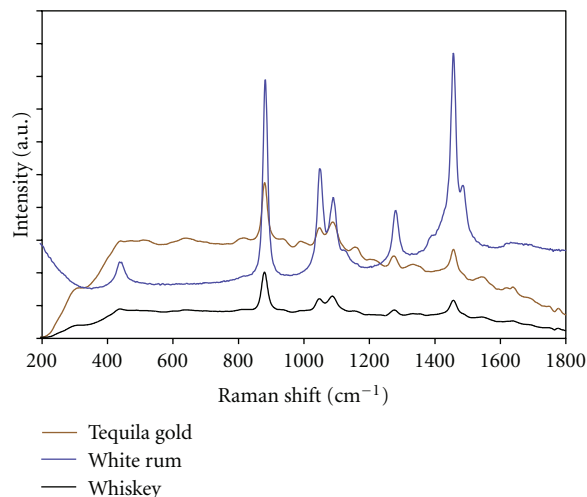


FIGURE 1: Raman spectrum of tequila, rum, and whiskey acquired with FOCRS. Parameters were 785 nm laser, 200 mW, and 2 s integration time. All liquors exhibited similar spectra preserving spectral features.

rum, Tequila Cuervo Gold, and Ralph perfume. Hydrogen peroxide (50 wt.% in water) and acetone (99+%) were obtained from Fisher Scientific International, Chicago, IL, USA. Cyclohexane ( $\geq 99\%$ ) and triethyl phosphate (TEP;  $\geq 99\%$ ) were obtained from Sigma-Aldrich Chemical Company (St. Louis, MO, USA).

**2.2. Measurements and Analysis.** Portable FOC-based instrument (Raman Systems model R-3000 HR) was used to evaluate the content of commercial products. The RS system had an excitation wavelength of 785 nm (red) with 250 mW maximum output power measured at the head of the probe. The spectra of the original liquid in its container were collected through the container walls. The liquid was then replaced with 30 mL of a hazardous liquid and analyzed. Liquids were mixed at random volume to volume ratios (v/v) to prepare a total of 50 mL. Raman spectra were acquired from  $200\text{ cm}^{-1}$  to  $1800\text{ cm}^{-1}$ . The system was calibrated using HPLC grade cyclohexane as an external standard by measuring the band at Raman shift location about  $801.3\text{ cm}^{-1}$ . The data was exported and manipulated using Grams v.9 (Thermo Fisher Scientific, Waltham, MA, USA). Pretreatments and PLS analyses and other calculations were performed using MATLAB v.8 (The Mathworks, Natick, MA, USA.), and PLS Toolbox Solo v. 6.3 (Eigenvector Technologies, Wenatchee, WA, USA.), and Excel v. 2010 (Microsoft, Redmond, WA, USA).

## 3. Results and Discussion

**3.1. Detection of Peroxide in Liquors.** The spectra of the three liquors: whiskey, rum, and tequila were obtained in their original clear glass bottle. The results are presented in Figure 1. The spectra of the liquors were substantially similar although there were some differences in relative peak intensities. The additives that render the yellowish (gold)

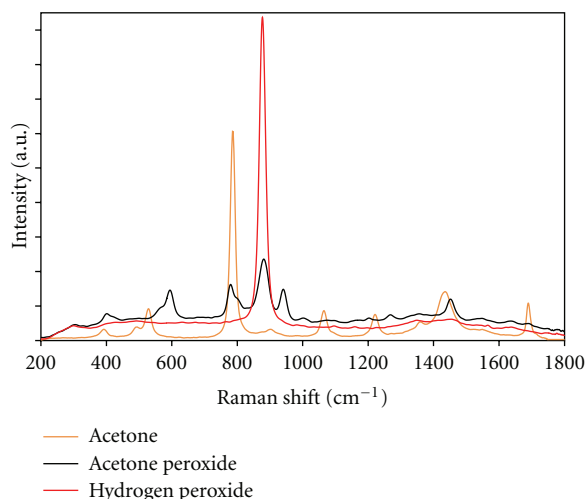


FIGURE 2: Raman spectra of acetone, hydrogen peroxide, and an acetone peroxide mixture contained in a clear glass bottle. Parameters were 785 nm, 10 s acquisition time at 200 mW of laser power. The characteristic peak for acetone is located at  $798\text{ cm}^{-1}$  and for peroxide at  $878\text{ cm}^{-1}$ . The main acetone peroxide peaks are located at  $588\text{ cm}^{-1}$ ,  $780\text{ cm}^{-1}$ ,  $890\text{ cm}^{-1}$ , and  $936\text{ cm}^{-1}$ .

color of the tequila and whiskey presented some fluorescence identified by the shift in the baseline of the spectra. However, it was possible to identify the main peaks associated with the alcohol content. These spectra as well as the spectrum for ethanol, the main component of hard liquors, present peaks at  $881\text{ cm}^{-1}$  (C–C–O symmetric stretch),  $1048\text{ cm}^{-1}$  (C–C–O asymmetric stretch) and  $1086\text{ cm}^{-1}$  (C–O stretch),  $1280\text{ cm}^{-1}$  (C–CH<sub>3</sub> deformation), and  $1456\text{ cm}^{-1}$  (C–H stretch in CH<sub>2</sub> and CH<sub>3</sub>) [20]. Then the contents of the clear glass bottle were replaced with acetone and hydrogen peroxide so that the contents appeared to be clear rum. These consumer products are easily acquired at beauty supplies and drugstores, but they are also precursors of acetone-peroxide, a well-known homemade explosive (HME) [21, 22].

The Raman spectra of acetone, peroxide, and acetone-peroxide are presented in Figure 2. The spectrum of acetone showed high-intensity peaks at  $530\text{ cm}^{-1}$  (C=O deformation),  $789\text{ cm}^{-1}$  (C–C symmetric stretch),  $1225\text{ cm}^{-1}$  (C–C asymmetric stretch), and  $1691\text{ cm}^{-1}$  (C=O stretch band). The most prominent vibrational Raman signature is located at  $789\text{ cm}^{-1}$  [23]. Hydrogen peroxide is characterized by a strong peak at  $878\text{ cm}^{-1}$ , characteristic of the O–O stretching mode. The main acetone peroxide peaks are located at  $400\text{ cm}^{-1}$  (ring breathing),  $594\text{ cm}^{-1}$  (O–C–O bending),  $779\text{ cm}^{-1}$  (O–C–O symmetric stretch and Me–C–Me symmetric stretch),  $880\text{ cm}^{-1}$  (O–O stretch and Me rocking synchronous and asynchronous),  $940\text{ cm}^{-1}$  (C–C stretch),  $1067\text{ cm}^{-1}$  (C–C and ring C–O stretch), and  $1451\text{ cm}^{-1}$  (H–C–H bend) [22–24]. The position, intensity, and uniqueness of the major peaks in acetone and peroxide make them easily detected by RS and can be used as markers for this explosive mixture [24, 25].

In Figure 3, the acetone and peroxide spectroscopic signatures are compared to those of rum. The rum spectrum

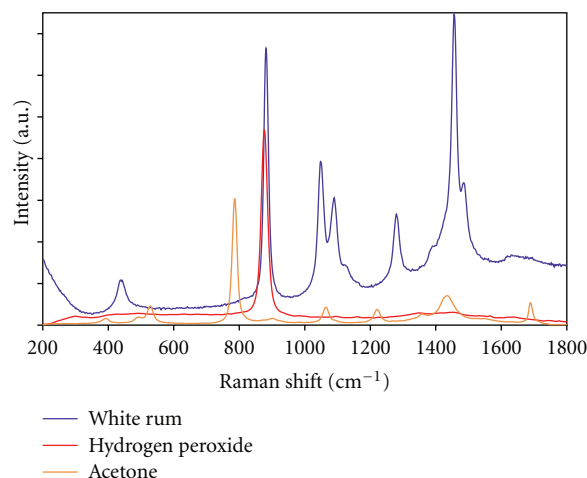


FIGURE 3: Spectroscopic signatures of rum versus acetone and peroxide. Parameters were 785 nm, 10 s, and a laser power of 200 mW. The characteristic band of acetone is present at  $798\text{ cm}^{-1}$ . The ethanol peak at  $881\text{ cm}^{-1}$  makes difficult the differentiation from the peroxide peak at  $878\text{ cm}^{-1}$ .

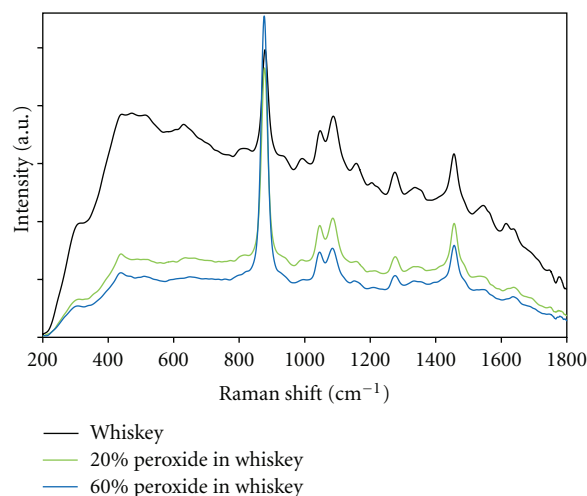


FIGURE 4: Raman spectra of a mixture of hydrogen peroxide and whiskey. Parameters were 785 nm laser 3 scans at 10 s with 200 mW laser power. The addition of peroxide caused no peak shifts but did increase the intensity of the band at  $874\text{ cm}^{-1}$ .

presents clear characteristic bands at  $881\text{ cm}^{-1}$ ,  $1048\text{ cm}^{-1}$ ,  $1086\text{ cm}^{-1}$ ,  $1280\text{ cm}^{-1}$ , and  $1456\text{ cm}^{-1}$  that together with known band ratios can be used to differentiate the rum from other liquids. In this case, acetone is clearly identifiable with a unique band at  $789\text{ cm}^{-1}$ . However the strong band at  $881\text{ cm}^{-1}$  due to C–C–O stretching that all liquors present is located in the same region of the hydrogen peroxide C–O band at  $878\text{ cm}^{-1}$ . This may represent a challenge for the detection of peroxide mixed with liquors.

Figure 4 shows the Raman spectra of 20% v/v and 60% v/v hydrogen peroxide prepared from 50% H<sub>2</sub>O<sub>2</sub> solution in water (10% and 30%, H<sub>2</sub>O<sub>2</sub> resp.) in whiskey. As previously mentioned, the spectroscopic signature of peroxide is hidden

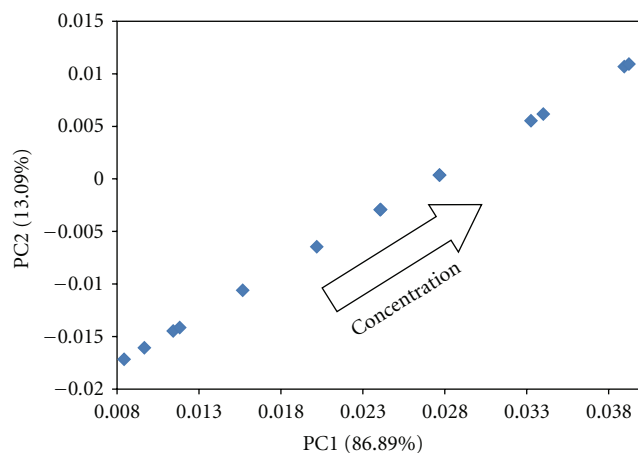


FIGURE 5: Scores of PC1 and PC2 (99.98% of the spectral variance) are related to the change in concentration of hydrogen peroxide. Quantification of mixtures can be efficiently carried out using these two components only.

or masked by the ethanolic peak at  $881\text{ cm}^{-1}$ . Samples from 0% to 90% peroxide in whiskey were analyzed without observing changes in the location of peaks. However, the presence of peroxide has an effect on the intensity of the band  $881\text{ cm}^{-1}$ .

PLS was used to build a model to determine the concentration of peroxide in whiskey. The data was evaluated in the range of  $200$  to  $1800\text{ cm}^{-1}$ , after spectral intensity normalization. Figure 5 shows the scores for principal components (PC's) 1 and 2. These two components are responsible for 99.98% of the variance in the spectra. The score on each spectrum for these components confirms that there are spectral differences in the data set as a consequence of concentration of peroxide.

An evaluation of the loadings provides information on the origin of the variance captured by PC1 and PC2. Figure 6 confirms that mainly the origin of the variance captured by PC1 and PC2 is within the area of the  $881\text{ cm}^{-1}$  peak. The PC2 suggests that there are contributions in the increase and the decrease of the intensity of the spectrum as well. This information is used to create a PLS regression of the spectral variance ( $x$ ) versus concentration of hydrogen peroxide ( $y$ ). This model was evaluated by a leave-one-out cross-validation. The results of the validation were evaluated by the root mean square error of calibration (RMSEC) and the root mean square error of cross-validation (RMSECV). In the first one, the values in the data set are predicted with the calibration curve obtained and in the second the values are estimated using a calibration curve that did not include this value. For the case of peroxide I whiskey, the prediction of % of peroxide versus actual concentration (Figure 7) can be achieved with a RMSEC of 2.23 and RMSECV of 2.69. The linearity of the fit is described by the  $R^2$  value (0.9945).

**3.2. Detection of Toxic Industrial Compounds in Personal Care Products.** Consumer products such as personal care and cosmetics present a challenge. Commonly these products

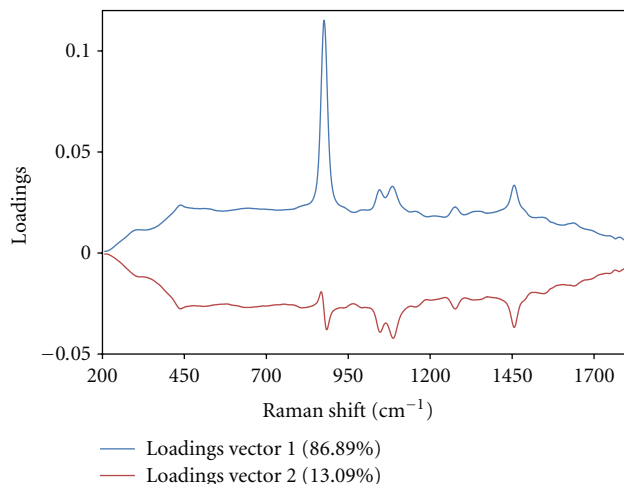


FIGURE 6: Loadings vectors for PC1 and PC2. The data confirms that spectral changes in the region of the hydrogen peroxide peak ( $878\text{ cm}^{-1}$ ) are responsible for most of the spectral variance.

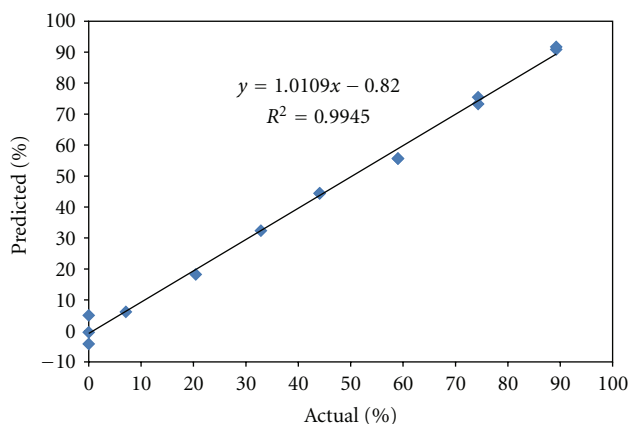


FIGURE 7: Prediction of the concentration of peroxide in whiskey showing a significant relation between concentration and spectral changes. This relation suggests that it is possible to discriminate between expected alcohol concentration in whiskey and the presence of other material contributing to this signal.

contain multiple ingredients such as alcohols, peroxides, and others with chemical composition related to hazardous chemicals. Many personal care products are also colored and present fluorescence, obscuring the persistent Raman signatures. The spectra of a perfume is shown in Figure 8. The spectrum was obtained in its original bottle. The spectrum of 10% acetone in the perfume is included. The fluorescence and peak of the perfume dominates the signature of the liquid.

Acetone was mixed with the perfume at concentration between 10–50% (volume by volume). At higher concentrations, the spectrum of acetone becomes more evident. After a first assessment of principal components and loadings vectors, the spectral range of  $600\text{ cm}^{-1}$  to  $1200\text{ cm}^{-1}$  was used to estimate the concentration of acetone in the perfume. The data was first mean centered. Figure 9 presents the predicted versus actual concentration obtained with a PLS



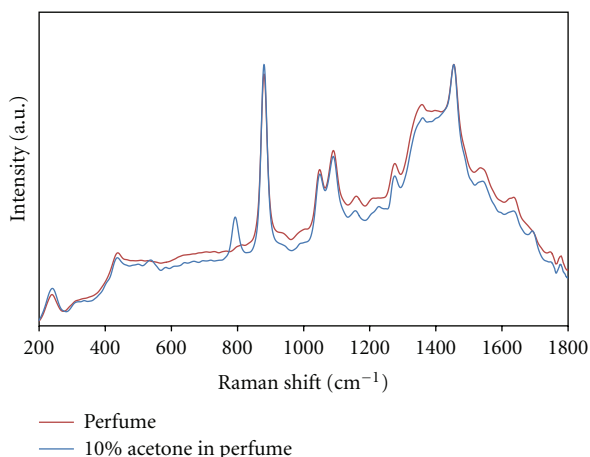


FIGURE 8: Raman spectra of a perfume and a mixture of perfume and 10% acetone. Parameters were 785 nm laser, 100 mW, and 10 s integration time. Presence of acetone is only suggested by the small peak at  $880\text{ cm}^{-1}$ .

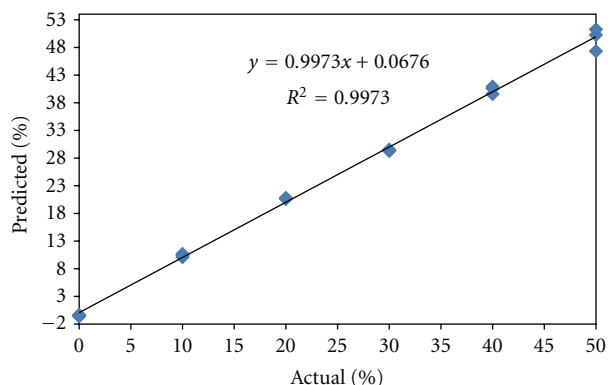


FIGURE 9: PLS determination of acetone in perfume. Conditions: spectral range: 600 to  $1200\text{ cm}^{-1}$ , mean centering of spectra, three components (PC's) used.

based model in this spectral region. Three components were used to achieve a RMSEC of 0.887 and a RMSECV of 1.287.

**3.3. Detection in Colored Liquids.** The detection of a CWA simulant in heavily colored liquids was studied by FOCRS. TEP is commonly used as a simulant of Soman (GD), a nerve agent. Figure 10 presents the spectra of different flavors of Gatorade described by colors. The red presents a higher baseline associated to fluorescence. No characteristic peaks were observed for the red, blue, or orange liquids at these conditions.

TEP Raman spectrum, as shown in Figure 11, has characteristic peaks such as  $733\text{ cm}^{-1}$  ( $\text{PO}_3$  symmetric stretch),  $813\text{ cm}^{-1}$  ( $\text{PO}_3$  asymmetric stretch),  $1032$  and  $1098\text{ cm}^{-1}$  (C–O stretch),  $1162\text{ cm}^{-1}$  ( $\text{CH}_3$  rocking), and  $1279\text{ cm}^{-1}$  (P–O symmetric stretch) [26]. TEP was then mixed randomly with the different colors of gatorade at concentration up to 85% v/v of TEP. Figure 11 shows the spectrum of TEP and its mixtures with red Gatorade at concentration 6% and

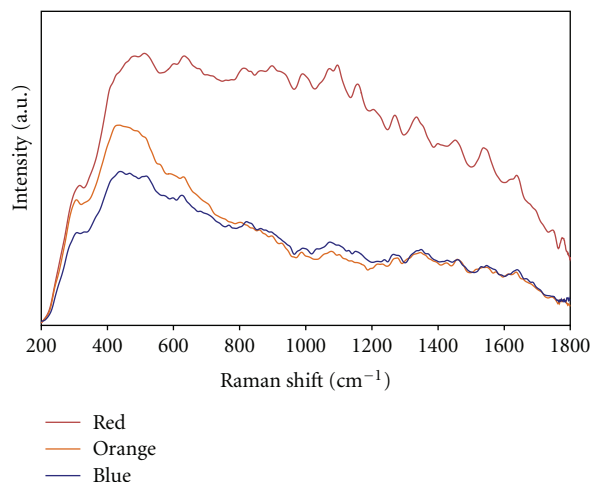


FIGURE 10: Raman spectra of red, blue, and orange Gatorade beverages. Parameters were 785 nm laser, 100 mW, and 10 s integration time.

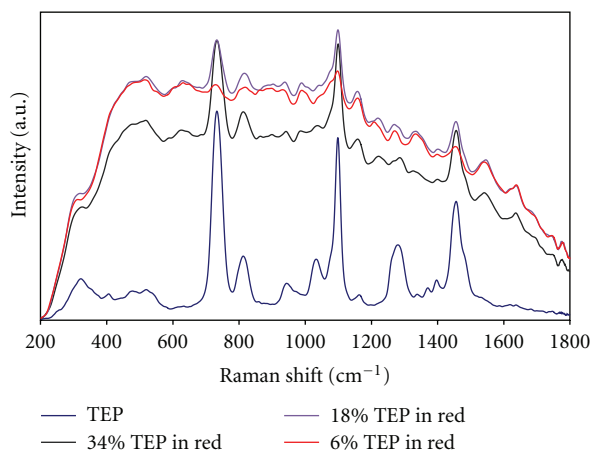


FIGURE 11: Spectrum of neat TEP and at different concentrations in red Gatorade. The spectral range of 200 to  $1800\text{ cm}^{-1}$  was used for PLS-based quantification.

34% of TEP. At concentrations higher than 50% of TEP, the signature could be easily distinguished over the spectrum of the beverage.

A discrimination exercise in which PLS was used to discriminate between samples with and without TEP was performed. For this experiment, all Gatorade samples that did not contain TEP were assigned a value of “−1”, and those that contained TEP were labeled as “1”. The samples with TEP had concentrations of the analyte in Gatorade as follows: 13% TEP in blue, 11% TEP in orange, 18% TEP in red, and 6% in red. A PLS-DA regression was performed, and the results are summarized in Figure 12. Specificity and sensitivity for each class ( $y = 1$  and  $y = -1$ ) was one (1). However, it is seen that, for samples in red Gatorade, this discrimination was not as evident as for other colors. Specifically the group of 6% TEP in red Gatorade obtained values close to zero, suggesting that this concentration of TEP is close to the detection limits of the approach. The thresholds



TABLE 1: LOD and LOQ for TEP in colored liquids.

Gatorade variety	PC's	Cumulative % variance	$R^2$ of prediction curve	RMSEC	LOD	LOQ
Red	2	99.99	0.998	1.52	6.5	21.8
Blue	2	95.72	0.967	2.85	5.2	17.2
Orange	2	99.58	0.961	4.30	10.4	35.2

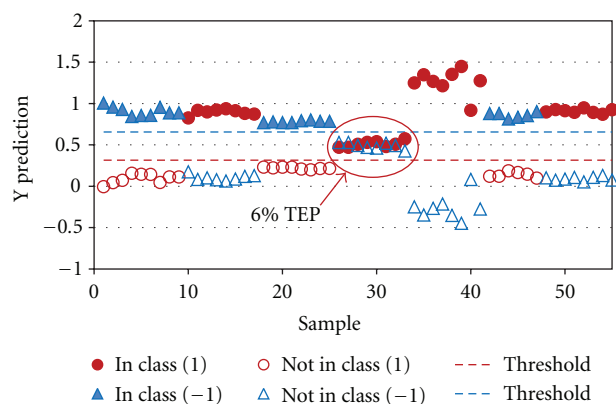


FIGURE 12: PLS-based discriminant analysis of TEP in different varieties of Gatorade. A positive value (1) implies presence of TEP, and a negative value (-1) do not contain TEP. Values close to the threshold line ( $x$  axis) indicate that samples are close in spectral character making more challenging the discrimination. For  $y = -1$  and 3 PC's;  $R^2_{cal} = 0.745$   $R^2_{CV} = 0.728$ , RMSEC = 0.249, and RMSECV = 0.257.

values for presence were 0.3156 and for not presence 0.6560. These values represent the critical value of prediction that will separate classes. Higher values will correspond to better discrimination. In this case, samples without contamination (pure liquids) were clearly discriminated from samples with contamination at low percentage of concentration.

PLS-quantitative analysis was performed on samples containing TEP at concentration levels lower than 50% since the presence of TEP is more obvious over that value. Quantification was performed by individual colors. The data was mean centered and analyzed by PLS in the range of  $200\text{ cm}^{-1}$  to  $1800\text{ cm}^{-1}$ . In order to compare the quantification, all results were compared at 2 PC's. However, improvement in the model with 3 and 4 components was observed. Data is summarized in Table 1. Results showed that quantification of TEP in these colored matrices can be achieved with good linearity and RMSECV of less than 5%.

Finally, the limits of detection (LOD) for this analyte were calculated according to the IUPAC (International Union of Pure and Applied Chemistry) criteria of  $3\sigma$  (3 times standard deviation of the peak-to-peak noise related to the slope of the linear regression function). When the signal is 3 times as great as the noise, it is readily detectable but still too small for accurate measurement. A signal that is 10 times as great as the noise is defined as the lower limit of quantification (LOQ), or the smallest amount that can be measured with reasonable accuracy [27].

For this study the region from  $675$  to  $855\text{ cm}^{-1}$  was integrated, and its relation to the concentration was evaluated by regression analysis to estimate LOD and LOQ. The objective of these graphs is to compare the limit of detection (LOD) and the limit of quantification (LOQ) between colored liquids. This region was selected because of the presence of the characteristic peaks for phosphates. This region will simulate the characteristic spectral region of real CWA and related simulants.

Table 1 presents a summary of the PLS-based detection as well as the LOD and LOQ obtained for TEP in Gatorade. The limits of detection for this analysis were at 10% or less with LOQ between 17 and 35%. However, the low RMSEC suggests that quantification can be achieved with PLS or other algorithms at levels close to the LOD.

## 4. Conclusions

In this work, concealed liquids scenarios were studied by FOCRS. A fiber optic coupled Raman probe was used to differentiate hazardous liquids from common drinks and consumer products by acquiring spectra through the container walls. PLS algorithms were used to quantify the liquids with RMSEC of less than 5%. These results demonstrated that Raman spectroscopy can be used as a tool to quickly determine if the content of a bottle is the intended commercial product or has been used to conceal a hazardous material. The fluorescence of a red liquid did not affect the detection of a CWA simulant in a clear glass container. The limits of detection for a hazardous liquid in a series of colored liquids were estimated in 6–10% using standard conditions and no data manipulation. This suggests that trace level detection can be achieved with enhanced experimental setups and statistical analysis of the data.

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